

# Airborne Microwave Radiometer Cloud Liquid Water Retrieval Validation and Examining Environmental Influences on Maritime Tropical Convection

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# Introduction and Purpose

- NASA Cloud, Aerosol and Monsoon Processes Philippines Experiment (**CAMP<sup>2</sup>Ex**), 20 Aug – 10 Oct 2019

– Reid et al. (2023)

- Investigate aerosol-radiation-cloud interactions in the maritime tropics
- Suite of instrumentation deployed on NASA P-3 aircraft, including the Advanced Microwave Precipitation Radiometer (AMPR)
- Purpose of this study:

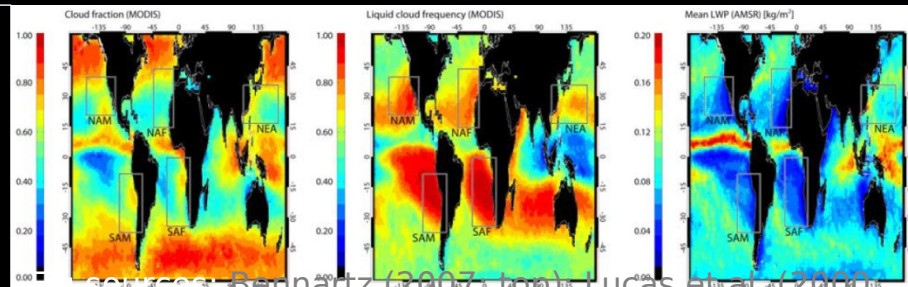
Photo © Corey Amiot



- Specific science questions for this presentation:
  - 1) How do AMPR's tropical cloud liquid water retrievals compare with expectations and independent validation data?
  - 2) How do variations in environmental conditions compare with AMPR and

# Literature Survey

- **Accurate airborne geophysical retrievals using brightness temperatures ( $T_b$ ) from microwave radiometers** (e.g., Wilheit and Chang 1980; Yeh et al. 1990; Wentz 1997; Wentz and Meissner 2000; Hong and Shin 2013)
- **AMPR** (Spencer et al. 1994) **cloud liquid water (CLW), water vapor, and 10-m wind speed retrievals developed for wintertime midlatitudes, results similar to expected uncertainties** (Amiot et al. 2021)
- **Cloud and rain liquid water content estimates from radar data, especially at finer wavelengths** (e.g., Hagen and Yuter 2003; Oh et al. 2018)
- **CLW correlated with satellite-retrieved cloud optical thickness and cloud droplet effective radius;  $CLW \propto (CTH)^2$**  (Bennartz 2007; Miller et al. 2016)  
- CTH = cloud-top height
- **CLW target uncertainties:  $2.0 \times 10^{-2} \text{ kg m}^{-2}$**  (Wentz and Meissner 2000); **AMPR:  $\sim 0.1 \text{ kg m}^{-2}$**  (Amiot et al. 2021)



by sources: Bernartz (2007, top); Lucas et al. (2000, bottom)

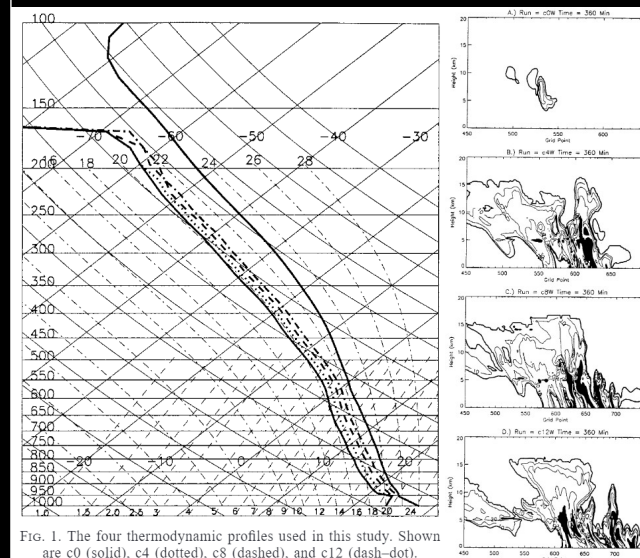


FIG. 1. The four thermodynamic profiles used in this study. Shown are c0 (solid), c4 (dotted), c8 (dashed), and c12 (dash-dot).

- Higher low-level water vapor and low-to-mid-level lapse rates may enhance convection, all else being equal (e.g., Lucas et al. 2000)

# Data and Instrument Overviews

## AMPR

- Advanced Microwave Precipitation Radiometer
- 50 cross-track pixels; scans  $\pm 45^\circ$  from nadir
- $T_b$  at 10.7, 19.35, 37.1, and 85.5 GHz
- Pure H and V polarized  $T_b$  via deconvolution
- CLW retrievals from combinations of 19.35, 37.1, and 85.5-GHz  $T_b$  data

## RSP

- Research Scanning Polarimeter
- Scans  $105^\circ$  along track; nadir data used here
- Radiance and scene polarization at nine spectral channels; 865 nm used here
- Cloud optical thickness (COT) and effective radius ( $r_e$ ) inferred from the 865-nm data

## APR-3

- Airborne Precip. & cloud Radar, 3rd Generation
- 25 cross-track pixels; scans  $\pm 25^\circ$  from nadir
- 13.4 (Ku), 35.6 (Ka), and 94 GHz (W band)
- 30-m range resolution
- Ku- and Ka-band equivalent radar reflectivity factor ( $Z_H$ ) and Doppler Velocity ( $V_r$ ) used here

## AVAPS

- Advanced Vertical Atmos. Profiling System
- Dropsonde system
- Temperature, pressure, and humidity @ 2 Hz
- 144 dropsondes examined from flights 05–19
- 10 dropsondes discarded during data QC

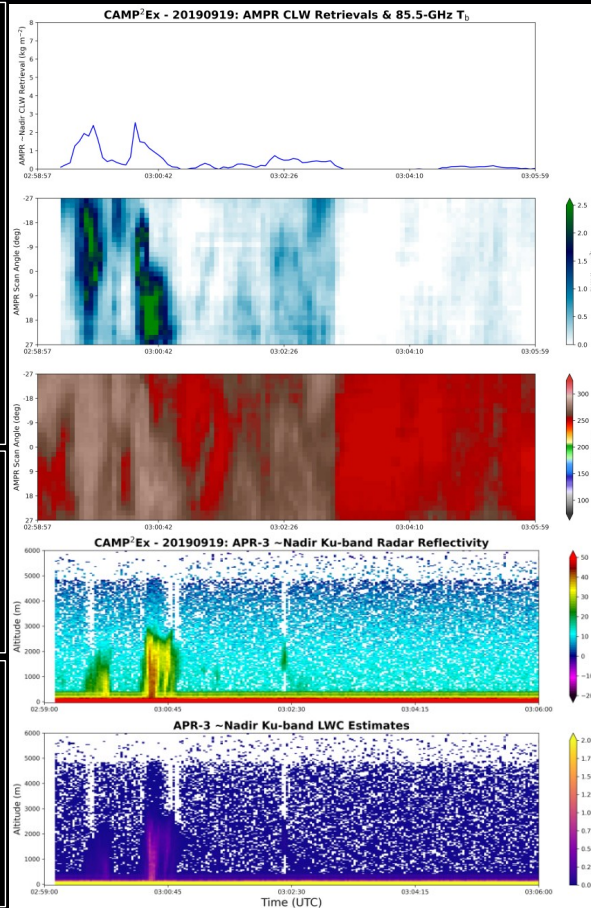
All data from joint CAMP<sup>2</sup>Ex-PISTON data

# Analysis Methods

- Match AMPR and APR-3 data in time (repeated for RSP & AVAPS)
- Focus on comparing ~nadir AMPR CLW & co-located APR-3 CLW
- AMPR masks: HALF, nadir-stare, land, precipitation, scan edges
- APR-3 data remapped and filtered for noise prior to analysis
- Ku band:  $W = 3.4z^{4/7}$ ,  $z$  in  $\text{mm}^6 \text{m}^{-3}$  (Hagen and Yuter 2003)
- Ka band:  $W = (z/103.83)^{1/1.08}$ ,  $z$  in  $\text{mm}^6 \text{m}^{-3}$  (Oh et al. 2018)
- Integrate  $W$  to get columnar CLW ( $\text{kg m}^{-2}$ ); calculate error statistics

- RSP nadir 865-nm data matched in time with AMPR nadir CLW
- RSP CLW =  $5/9 \cdot \rho_w \cdot \text{COT} \cdot r_e$ ,  $r_e$  in m (Bennartz 2007; Miller et al. 2016)
- RSP-derived CTH and CLW compared with AMPR CLW

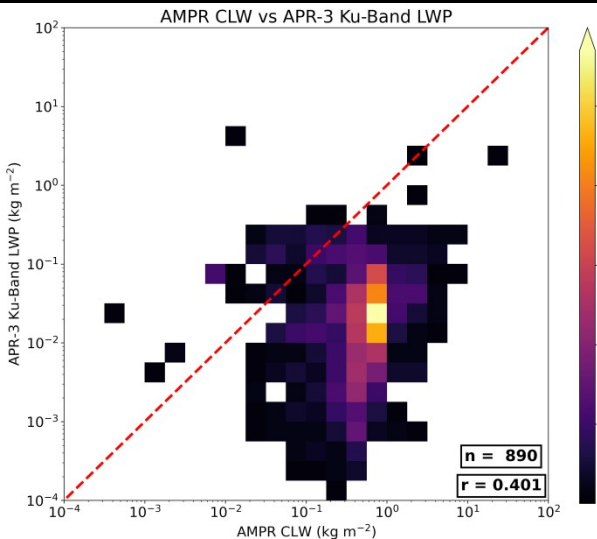
- AVAPS data analyzed on flight-by-flight basis and individually
- For latter, calculated: 700-hPa  $w$ , modified CAPE, K Index, LCL altitude, low- and mid-level lapse rates, and mean low-level  $T_d$
- Compared with AMPR CLW and APR-3  $Z_H$  (maximum, # > 30 dBZ)



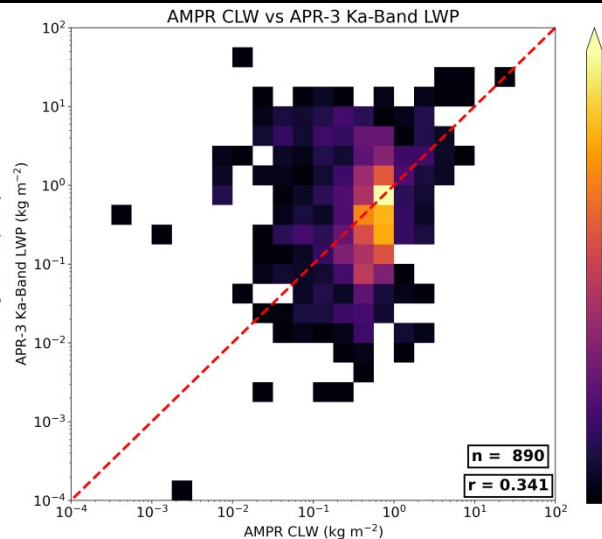


# AMPR CLW Validation Results

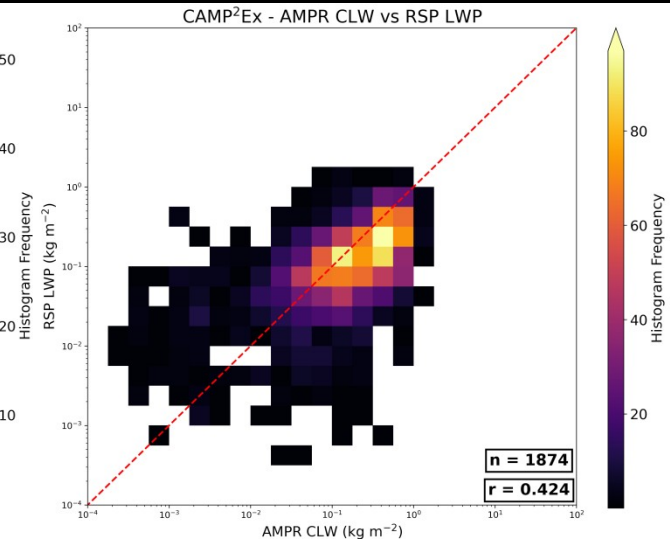
## Ku-Band APR-3



## Ka-Band APR-3



## RSP

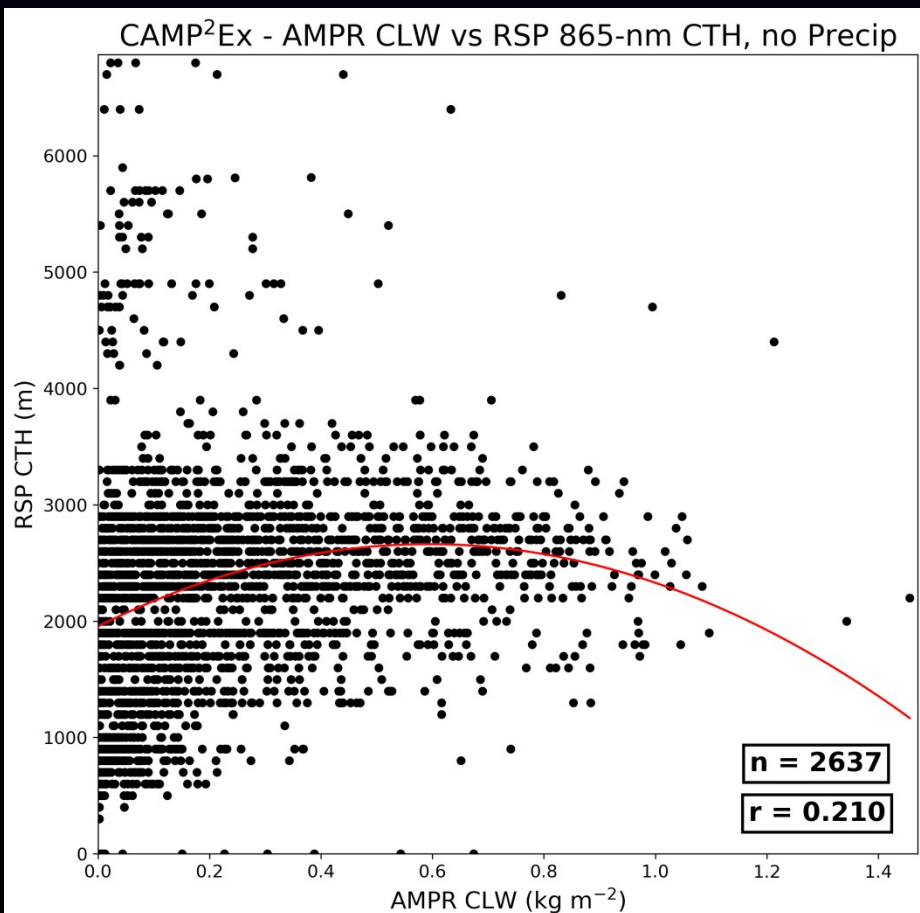


- MedAE:  $0.410 \text{ kg m}^{-2}$
- Percent Error:  $3.39 \times 10^3 \%$
- Bias:  $-0.155 \text{ kg m}^{-2}$

- MedAE:  $0.432 \text{ kg m}^{-2}$
- Percent Error:  $85.7\%$
- Bias:  $-7.02 \times 10^{-2} \text{ kg m}^{-2}$

- MedAE:  $8.08 \times 10^{-2} \text{ kg m}^{-2}$
- Percent Error:  $86.0\%$
- Bias:  $-3.28 \times 10^{-2} \text{ kg m}^{-2}$

# AMPR CLW versus RSP CTH



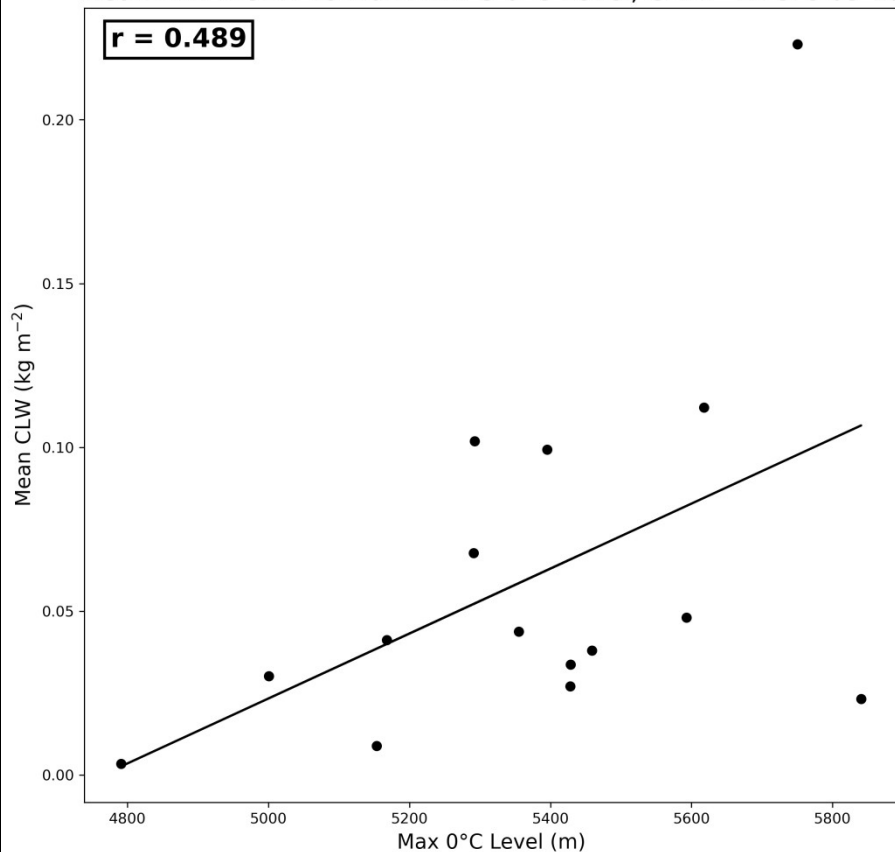
Clustering of  
low CLW  
values for CTH  
> 4 km

Anticipated  
 $CLW \propto (CTH)^2$   
relation for  
CTH < 4 km

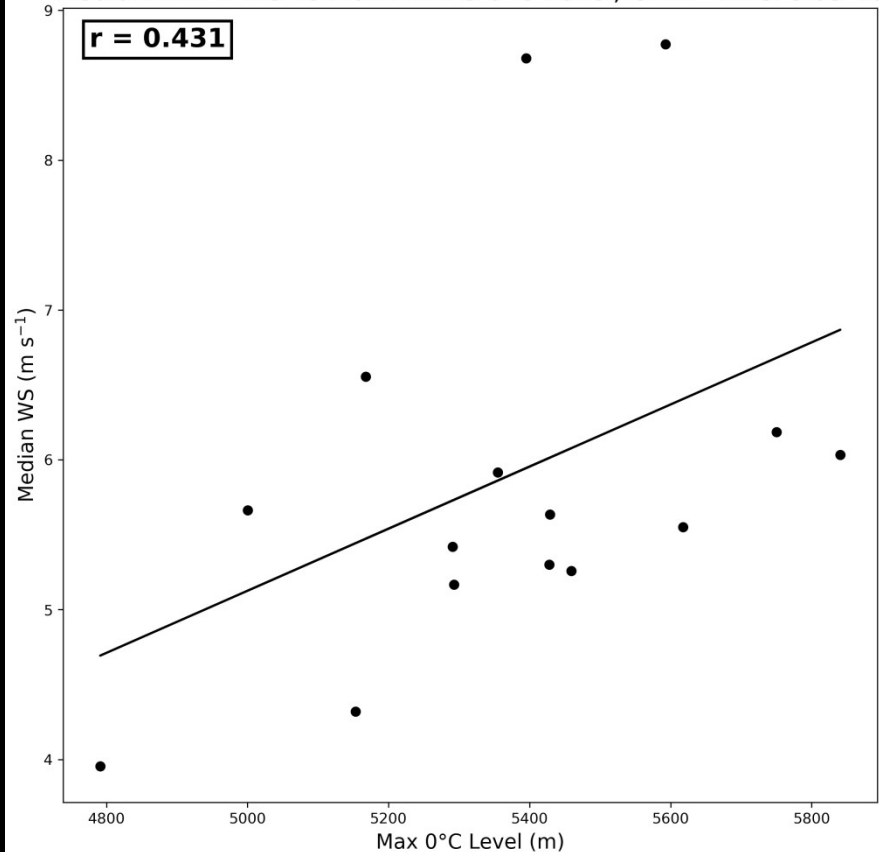
- AMPR CLW vs RSP CTH for all available precip-masked data points in CAMP<sup>2</sup>Ex flights 05–19
- Expected trends in CLW-CTH relation for CTH < 4 km AGL
- Sudden drop-off in CLW for CTH > 4 km
- **Potentially indicative of accretion onset at CTH > 4 km**, since rain data are largely excluded
- Perhaps influenced

# Flight-by-Flight Dropsonde Results

Mean AMPR CLW vs Max AVAPS 0°C Level, CAMP<sup>2</sup>Ex SFs 05-19

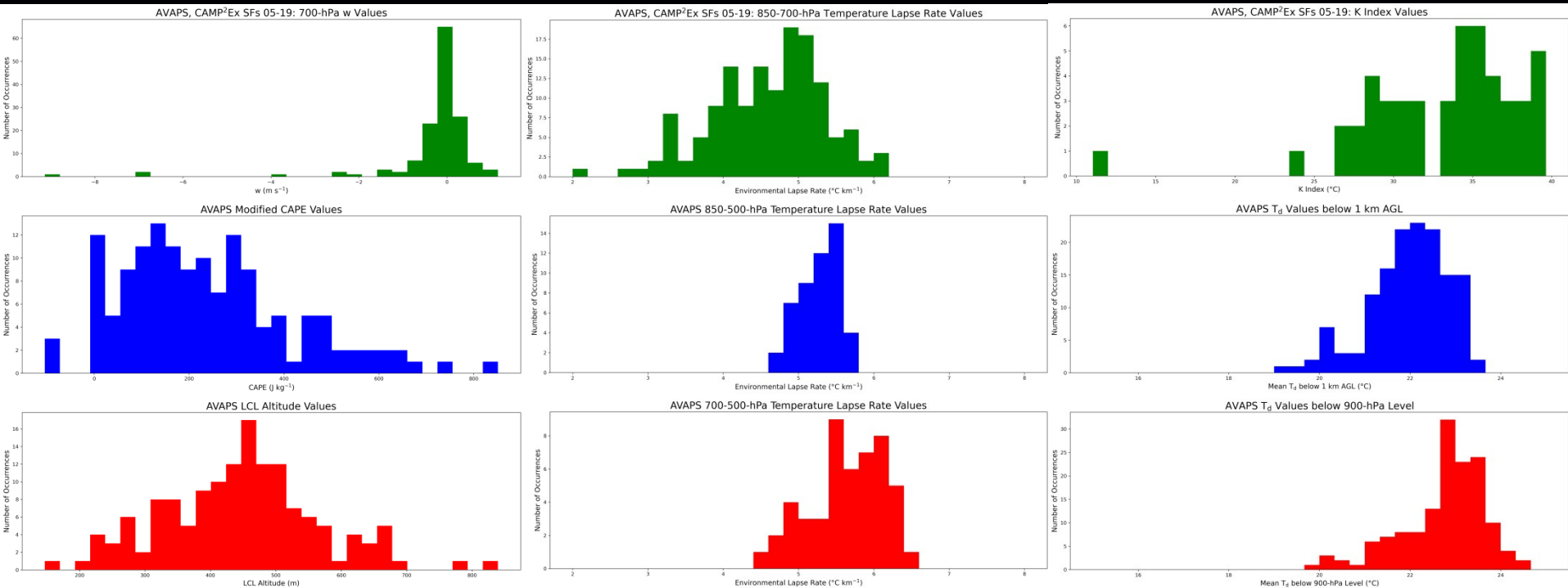


Median AMPR WS vs Max AVAPS 0°C Level, CAMP<sup>2</sup>Ex SFs 05-19





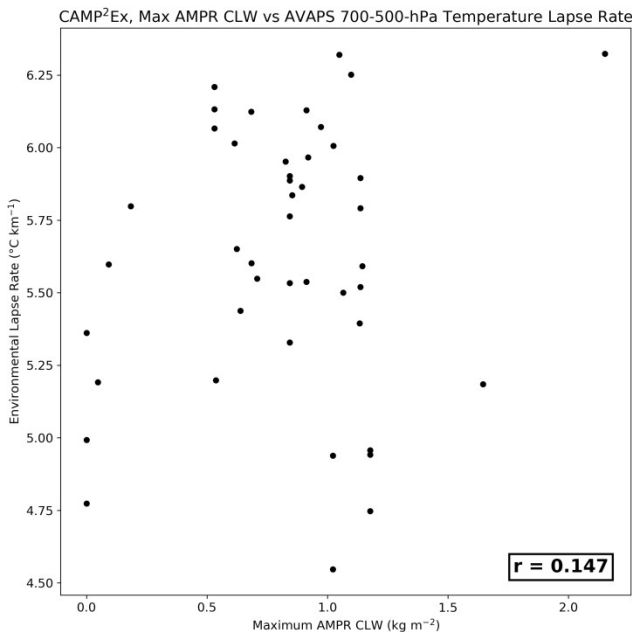
# Overview of Derived AVAPS Values



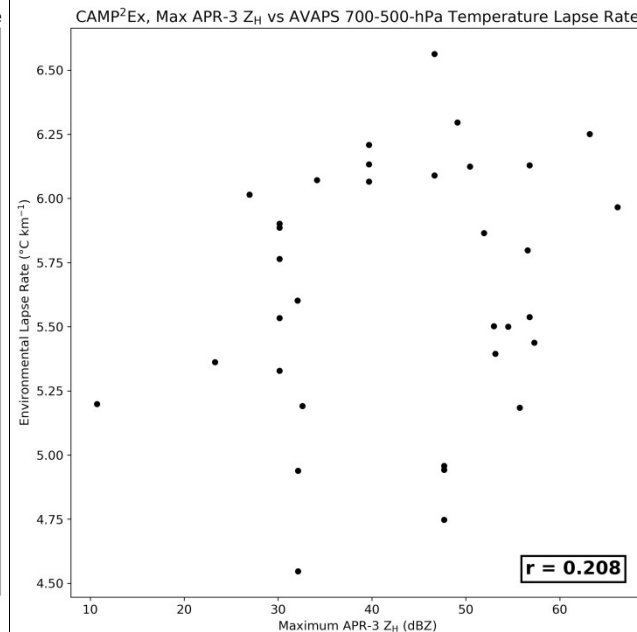
- Greatest variation in: modified CAPE, LCL altitude, 850-700-hPa lapse rate, and K Index
- Lapse rates (LRs) generally stable to conditionally unstable; low-level  $T_d$  nearly always

# 3

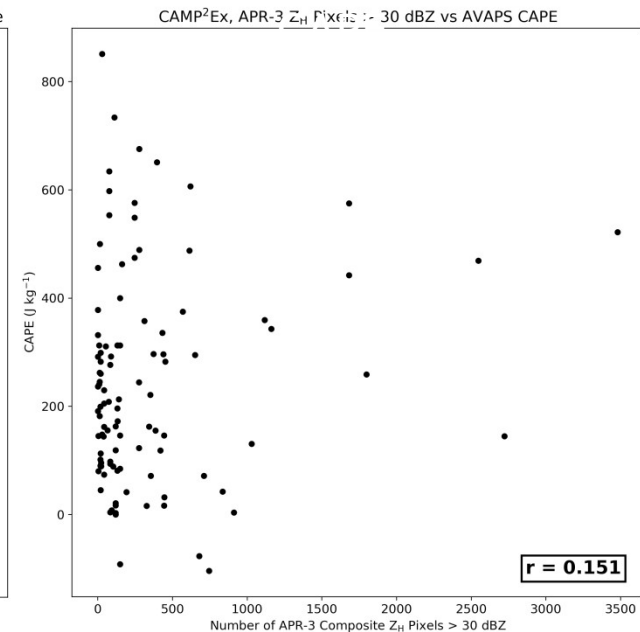
## CLW vs 700-500-hPa LR



## Max $Z_H$ vs 700-500-hPa LR



## # $Z_H > 30$ dBZ vs Mod.



- Most other AVAPS-derived parameters yielded correlation coefficient near 0 or an unexpected negative correlation with AMPR CLW and/or APR-3  $Z_H$ 
  - Will be examined in greater detail as part of near-future work

# Summary

- Study focused on AMPR tropical CLW retrievals, their validation, and comparisons with environmental data
- Favorable CLW error statistics with RSP ( $\text{MedAD} = 8.08 \times 10^{-2} \text{ kg m}^{-2}$ ; percent error = 86.0%); generally higher errors when CLW compared with APR-3 (several limitations)
- $\text{CLW} \propto (\text{CTH})^2$  for  $\text{CTH} < 4 \text{ km}$ , but clustering of lower CLW values for  $\text{CTH} > 4 \text{ km}$  may indicate accretion onset
- Max AVAPS 0°C level moderately correlated with AMPR mean CLW and median WS
- 700–500-hPa weak direct correlation with max AMPR CLW and max APR-3 composite  $Z_H$
- Modified CAPE weak direct correlation with # of APR-3 composite  $Z_H$  pixels  $> 30 \text{ dBZ}$

# Future Work

- Investigate potential accretion identification from AMPR CLW / RSP CTH data further
- Revisit analysis of individual dropsondes, see if any stronger correlations can be found
- Evaluate other APR-3 and AMPR statistics and/or parameters (e.g., mean values for CLW and  $Z_H$ , water vapor and wind speed retrievals)
- Consider additional environmental parameters, (e.g., Total Totals Index, convective inhibition)
- RSP-AVAPS analyses
- Incorporate aerosol information (e.g., from airborne lidar) to examine potential influences on maritime tropical convection

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- Jay Mace (The University of Utah): CAMP<sup>2</sup>Ex AMPR/APR-3 proposal PI
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- Larry Carey (UAH): computer resources and helpful feedback

# References

- Amiot, C. G., S. K. Biswas, T. J. Lang, and D. I. Duncan, 2021: Dual-polarization deconvolution and geophysical retrievals from the Advanced Microwave Precipitation Radiometer during OLYMPEx/RADEX. *J. Atmos. Oceanic Technol.*, **38**, 607–628, <https://doi.org/10.1175/JTECH-D-19-0218.1>.
- Bennartz, R., 2007: Global assessment of marine boundary layer cloud droplet number concentration from satellite. *J. Geophys. Res.*, **112**, D02201, <https://doi.org/10.1029/2006JD007547>.
- Hagen, M., and S. E. Yuter, 2003: Relations between radar reflectivity, liquid-water content, and rainfall rate during the MAP SOP. *Quart. J. Roy. Meteor. Soc.*, **129**, 477 – 493, <https://doi.org/10.1256/qj.02.23>.
- Hong, S., and I. Shin, 2013: Wind speed retrieval based on sea surface roughness measurements from spaceborne microwave radiometers. *J. Appl. Meteor. Climatol.*, **52**, 507–516, <https://doi.org/10.1175/JAMC-D-11-0209.1>.
- Lucas, C., E. J. Zipser, and B. S. Ferrier, 2000: Sensitivity of tropical west Pacific oceanic squall lines to tropospheric wind and moisture profiles. *J. Atmos. Sci.*, **57**, 2351–2373, [https://doi.org/10.1175/1520-0469\(2000\)057<2351:SOTWPO>2.0.CO;2](https://doi.org/10.1175/1520-0469(2000)057<2351:SOTWPO>2.0.CO;2).
- Miller, D. J., Z. Zhang, A. S. Ackerman, S. Platnick, and B. A. Baum, 2016: The impact of cloud vertical profile on liquid water path retrieval based on the bispectral method: A theoretical study based on large-eddy simulations of shallow marine boundary layer clouds. *J. Geophys. Res. Atmos.*, **121**, 4122–4141, <https://doi.org/10.1002/2015JD024322>.
- Oh, S.-B., Y. H. Lee, J.-H. Jeong, Y.-H. Kim, and S. Joo, 2018: Estimation of the liquid water content and Z-LWC relationship using Ka-band cloud radar and a microwave radiometer. *Meteor. Appl.*, **125**, 423–434, <https://doi.org/10.1002/met.1710>.
- Reid, J. S., and Coauthors, 2023: The coupling between tropical meteorology, aerosol lifecycle, convection and the energy budget: The Cloud, Aerosol and Monsoon Processes Philippines Experiment (CAMP2Ex). *Bull. Amer. Meteor. Soc.*, in revision.
- Spencer, R. W., R. E. Hood, F. J. LaFontaine, E. A. Smith, R. Platt, J. Galliano, V. L. Griffin, and E. Lobl, 1994: High-resolution imaging of rain systems with the Advanced Microwave Precipitation Radiometer. *J. Atmos. Oceanic Technol.*, **11**, 849–857, [https://doi.org/10.1175/1520-0426\(1994\)011<0849:HRIOBS>2.0.CO;2](https://doi.org/10.1175/1520-0426(1994)011<0849:HRIOBS>2.0.CO;2).
- Wentz, F. J., 1997: A well-calibrated ocean algorithm for special sensor microwave / imager. *J. Geophys. Res.*, **102**, 8703–8718, <https://doi.org/10.1029/96JC01751>.
- Wentz, F. J., and T. Meissner, 2000: Algorithm theoretical basis document (ATBD), version 2: AMSR ocean algorithm. Remote Sensing Systems Technical Proposal 121599A-1, 67 pp. <https://eosps0.gsfc.nasa.gov/sites/default/files/atbd/atbd-amr-ocean.pdf>.
- Wilheit, T. T., and A. T. C. Chang, 1980: An algorithm for retrieval of ocean surface and atmospheric parameters from the observations of the scanning multichannel microwave radiometer. *Radio Sci.*, **15**, 525–544, <https://doi.org/10.1029/RS015i003p00525>.
- Yeh, H.-Y. M., N. Prasad, R. A. Mack, and R. F. Adler, 1990: Aircraft microwave observations and simulations of deep convection from 18 to 183 GHz. Part II: Model results. *J. Atmos. Oceanic Technol.*, **7**, 392–410, [https://doi.org/10.1175/1520-0426\(1990\)007<0392:AMOASO>2.0.CO;2](https://doi.org/10.1175/1520-0426(1990)007<0392:AMOASO>2.0.CO;2).

All data available at CAMP<sup>2</sup>Ex-PISTON data repository:

<https://www-air.larc.nasa.gov/cgi-bin/ArcView/camp2ex>